

Goddard Space Flight Center

# Land Information System

## The Impact of Soil Moisture and Snow Assimilation on NLDAS Drought Metrics

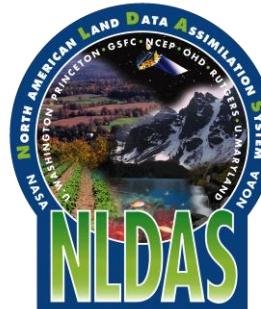
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# Outline

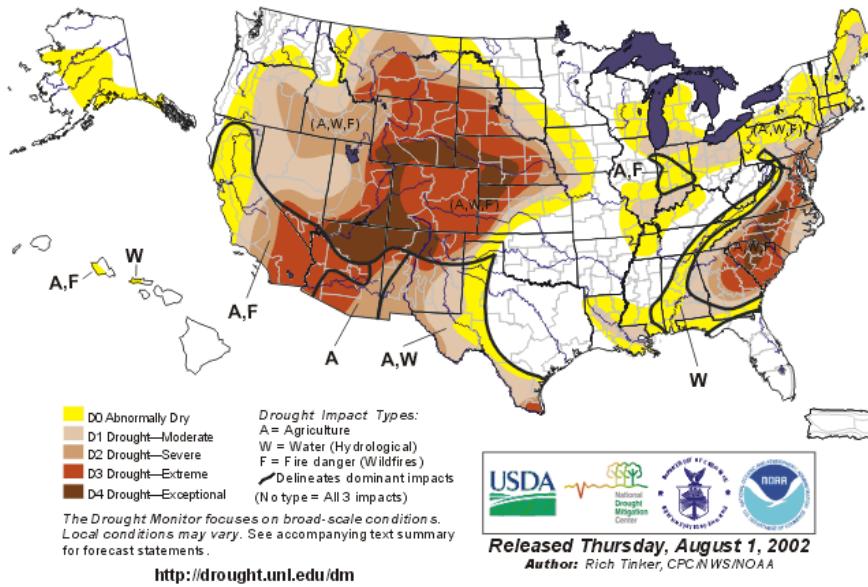
- NLDAS Drought Monitoring Background
  - 3 NOAA/MAPP DTF Case Studies: Comparisons with USDM
- Soil Moisture Assimilation
  - Evaluation vs. in situ Soil Moisture and Streamflow
  - Impacts on Drought Metrics
- Snow Assimilation
  - Evaluation vs. in situ SWE/Depth and Streamflow
  - Impacts on Drought Metrics

# Jul 2002

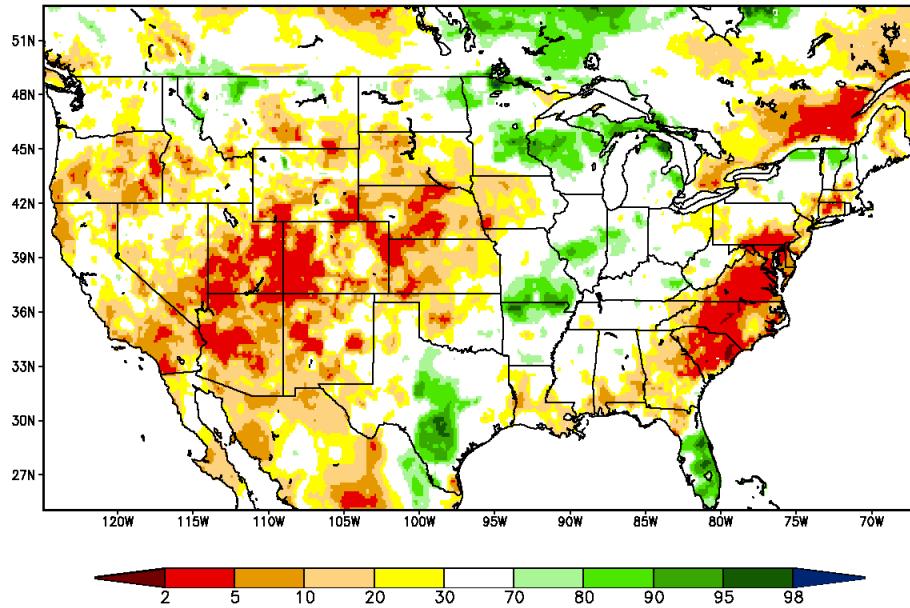
## U.S. Drought Monitor

July 30, 2002

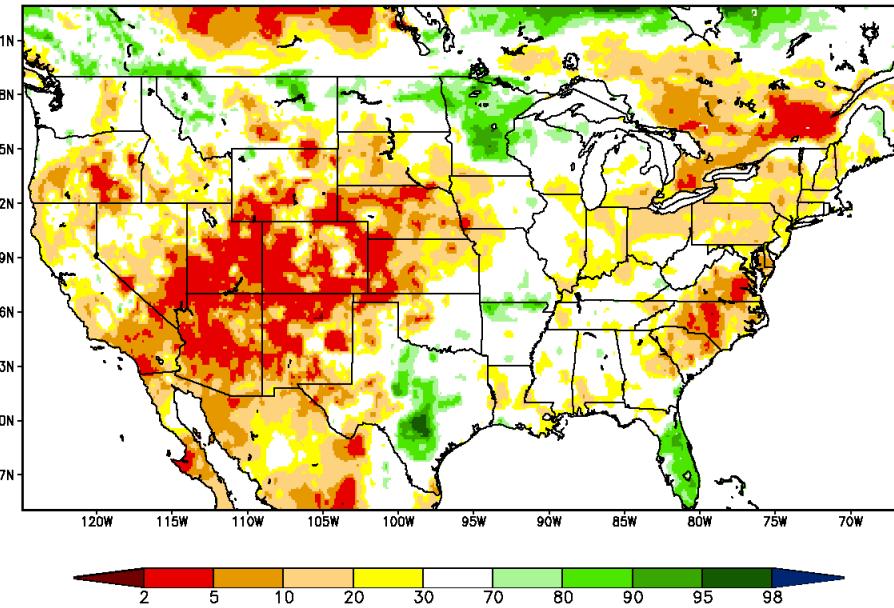
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NASA Mosaic – Past Month Total Column Soil Moisture Percentile  
Valid: JUL 30, 2002

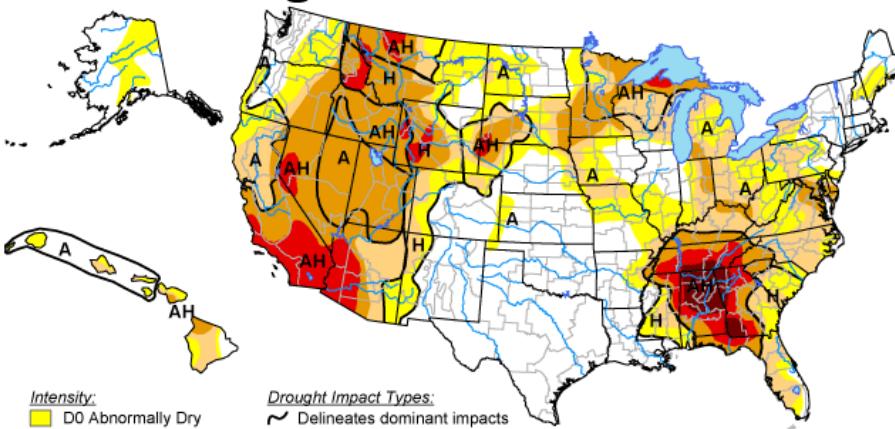


NCEP Noah – Past Month Total Column Soil Moisture Percentile  
Valid: JUL 30, 2002



# Aug 2007 U.S. Drought Monitor

August 7, 2007  
Valid 8 a.m. EDT



**Intensity:**  
D0 Abnormally Dry  
D1 Drought - Moderate  
D2 Drought - Severe  
D3 Drought - Extreme  
D4 Drought - Exceptional

**Drought Impact Types:**  
A = Agricultural (crops, pastures, grasslands)  
H = Hydrological (water)

The Drought Monitor focuses on broad-scale conditions.  
Local conditions may vary. See accompanying text summary  
for forecast statements.

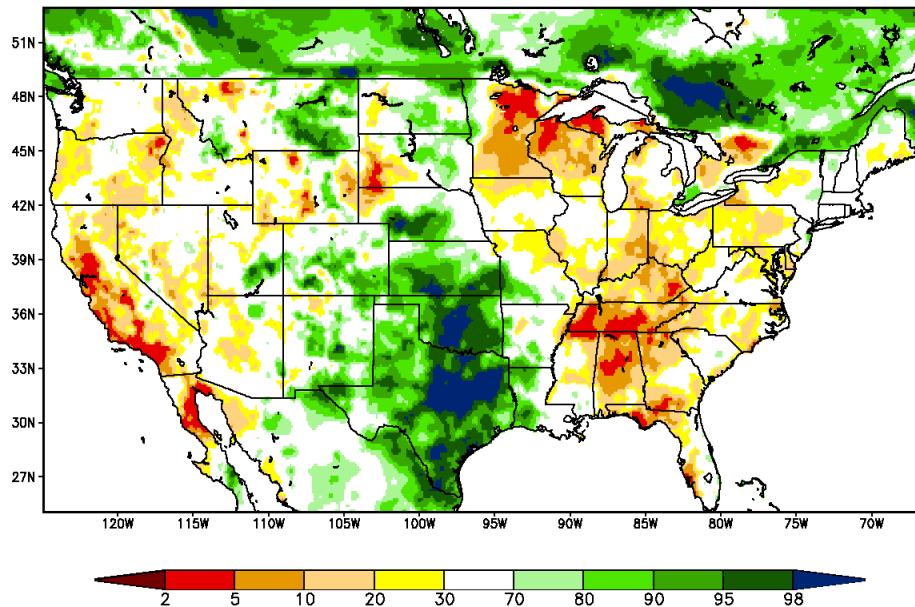
<http://drought.unl.edu/dm>



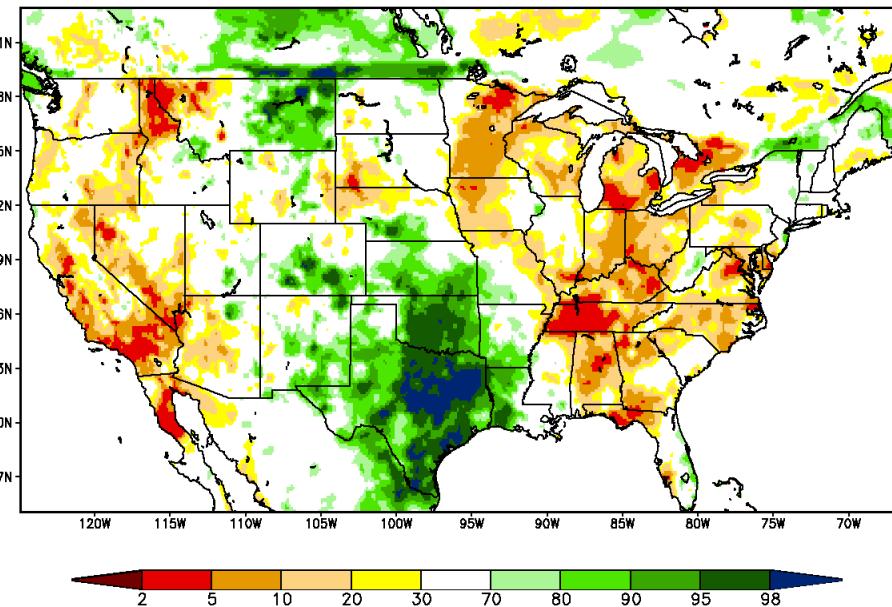
Released Thursday, August 9, 2007

Author: Brian Fuchs, National Drought Mitigation Center

NASA Mosaic – Past Month Total Column Soil Moisture Percentile  
Valid: AUG 07, 2007

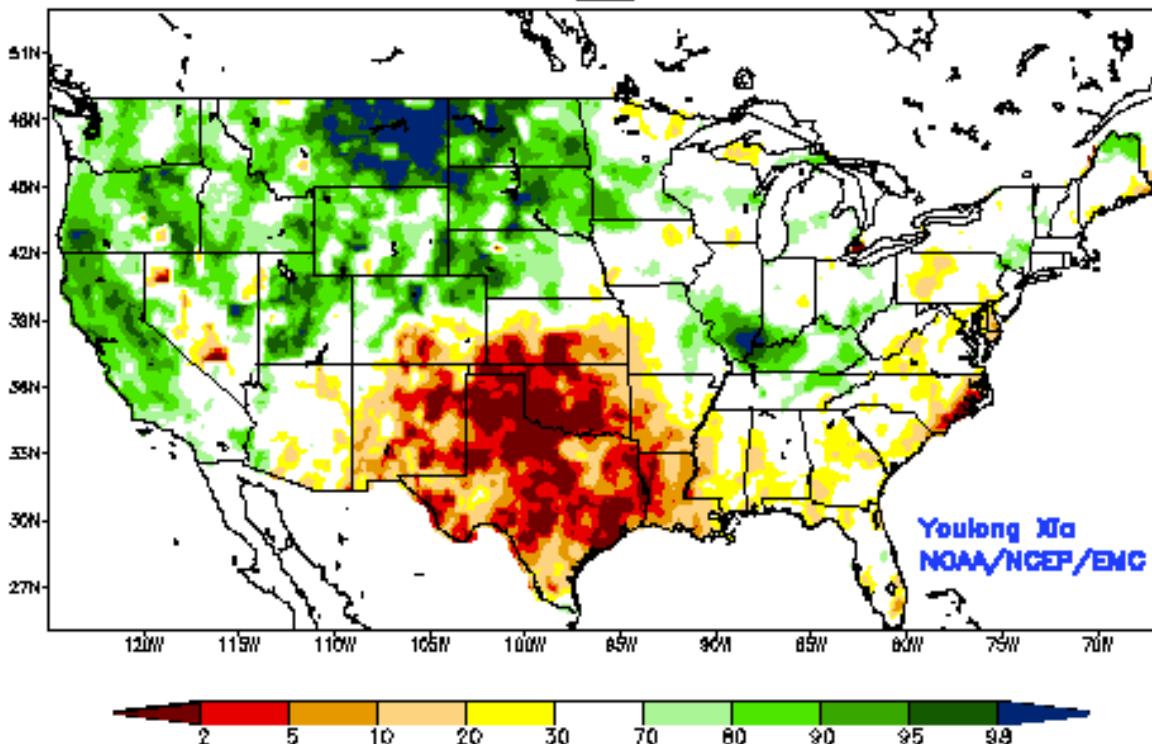


NCEP Noah – Past Month Total Column Soil Moisture Percentile  
Valid: AUG 07, 2007

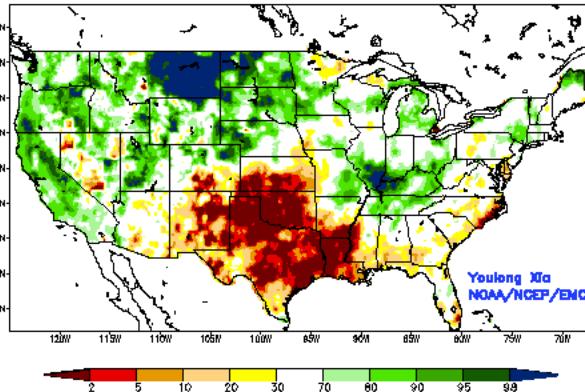


# Aug 2011

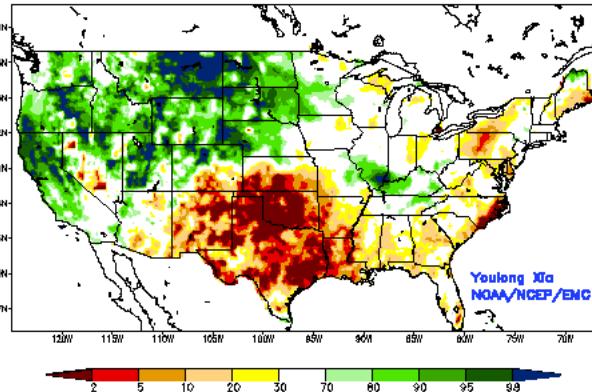
Ensemble-Mean – Past Month Total Column Soil Moisture Percentile  
NCEP NLDAS Products Valid: AUG 01, 2011



NASA Mosaic – Past Month Total Column Soil Moisture Percentile  
Valid: AUG 01, 2011

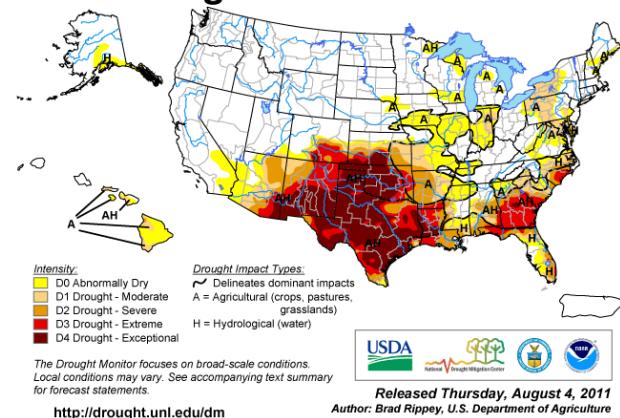


NCEP Noah – Past Month Total Column Soil Moisture Percentile  
Valid: AUG 01, 2011

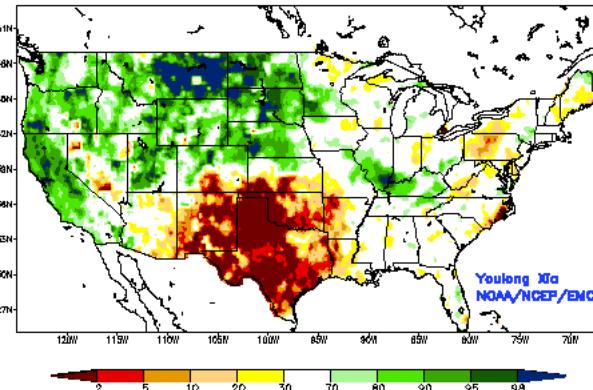


## U.S. Drought Monitor

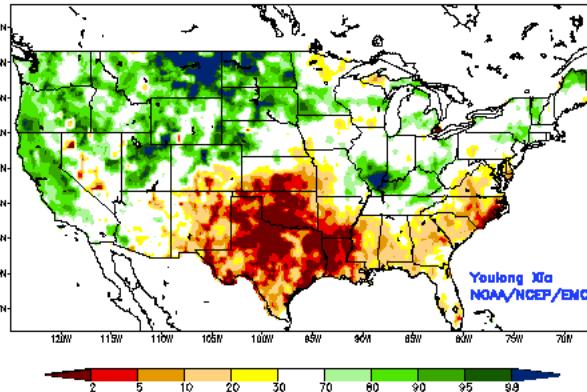
August 2, 2011  
Valid 8 a.m. EDT



Princeton VIC – Past Month Total Column Soil Moisture Percentile  
Valid: AUG 01, 2011



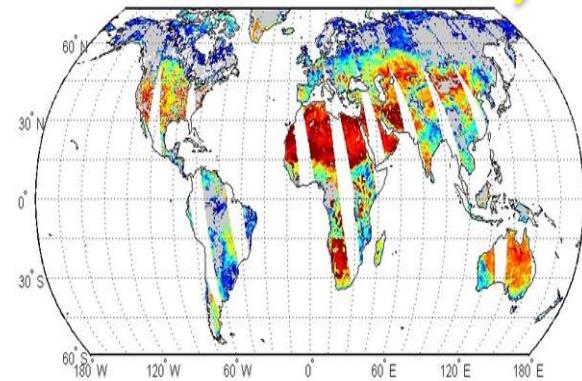
OHD SAC – Past Month Total Column Soil Moisture Percentile  
Valid: AUG 01, 2011



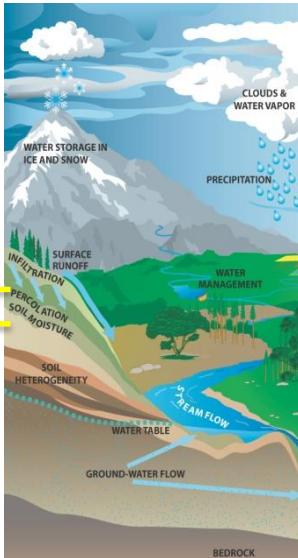
# Soil Moisture Data Assimilation

## Experimental Setup:

- Domain: CONUS, NLDAS
- Resolution: 0.125 deg.
- Period: 1979-01 to 2012-01
- Forcing: NLDASII
- LSM: Noah 3.3



**Figure 3:** Daily soil moisture based on Aqua/AMSR-E. Future observations will be provided by SMAP.



## Data Assimilation:

- ESA ECV (Liu et al., 2012; Wagner et al., 2012) 1978-2011
- Flags: light and moderate vegetation, precipitation, snow cover, frozen ground, RFI
- The observations are scaled to the LSM's climatology using CDF matching
- 12-member ensemble
- A spatially distributed observation error standard deviation (between 0.02-0.12 m<sup>3</sup>/m<sup>3</sup>)

# Evaluation of NLDAS outputs

## Soil moisture:

USDA Soil Climate Analysis Network (SCAN); 37 stations chosen after careful quality control (used for evaluations between 2000-2011)

Four USDA ARS experimental watersheds (“CalVal” sites) (used for evaluations between 2001-2011)

## Streamflow:

Gauge measurements from unregulated USGS streamflow stations (1981-2011).

## Snow depth:

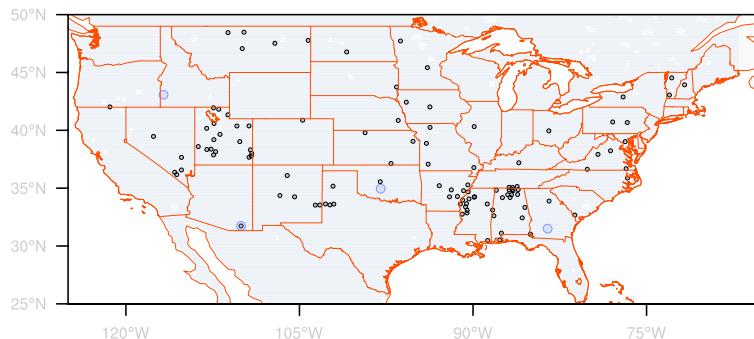
Global Historical Climate Network (GHCN) – used for evaluations between 1979-2011.

Canadian Meteorological Center (CMC) daily snow depth analysis – used for evaluations between 1998-2011.

All model verifications and analysis generated using the Land surface Verification Toolkit (LVT; Kumar et al. 2012)

# Soil moisture DA (ECV) : Evaluation of soil moisture fields

- SCAN stations
- CalVal stations



Statistically significant improvements in surface soil moisture and root zone soil moisture as a result of soil moisture DA

Anomaly R increases, Anomaly RMSE reduces and unbiased RMSE reduces with soil moisture assimilation.

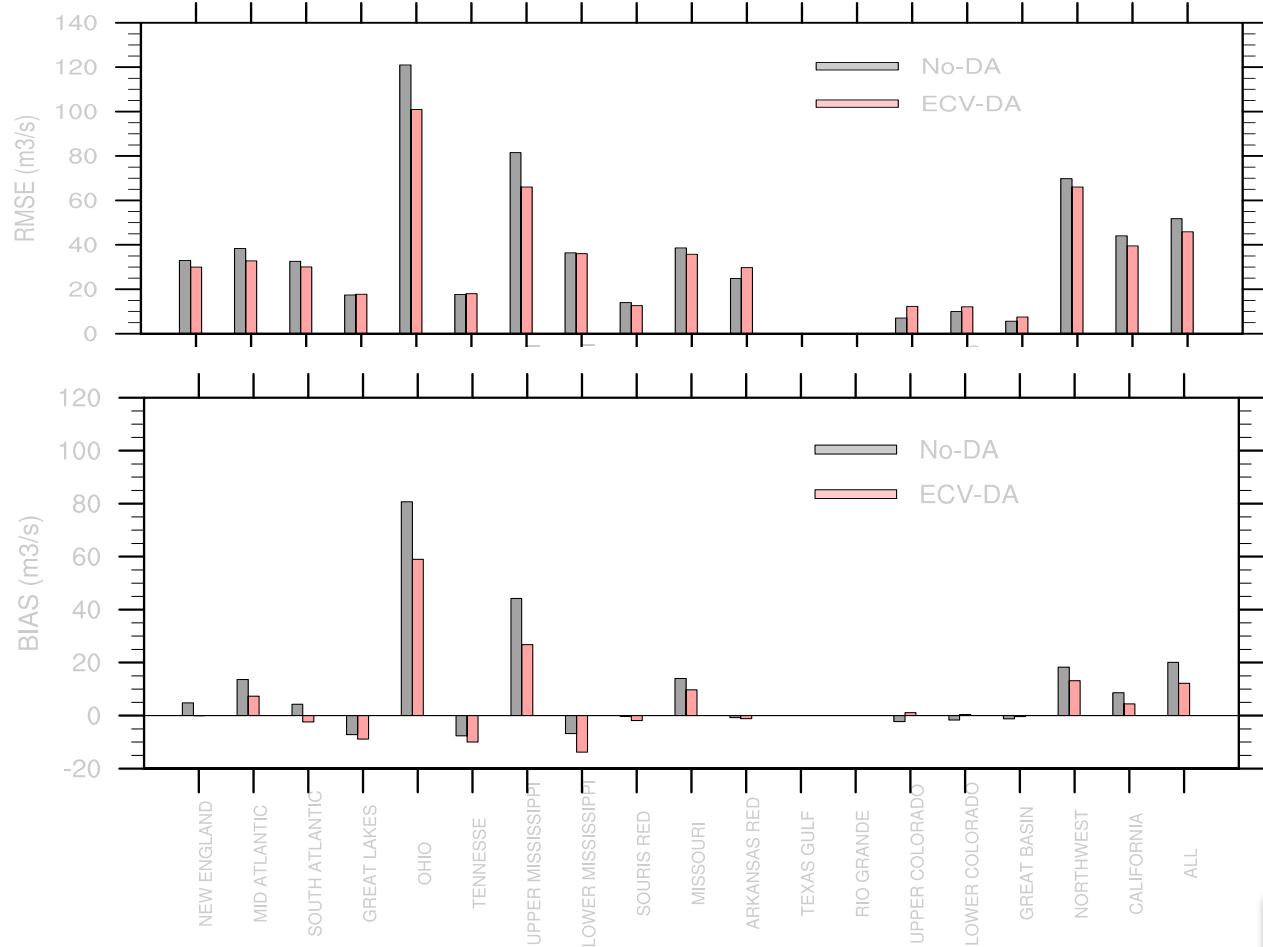
<b>ARS CalVal (surface soil moisture)</b>	<b>Open loop (no DA)</b>	<b>Soil moisture DA</b>
Anomaly R	0.74 +/- 0.01	<b>0.76 +/- 0.01</b>
Anomaly RMSE (m <sup>3</sup> /m <sup>3</sup> )	0.034 +/- 0.001	<b>0.030 +/- 0.001</b>
ubRMSE (m <sup>3</sup> /m <sup>3</sup> )	0.041 +/- 0.002	<b>0.037 +/- 0.002</b>

<b>SCAN (surface soil moisture)</b>	<b>Open loop (no DA)</b>	<b>Soil moisture DA</b>
Anomaly R	0.60 +/- 0.02	<b>0.71 +/- 0.02</b>
Anomaly RMSE (m <sup>3</sup> /m <sup>3</sup> )	0.044 +/- 0.002	<b>0.041 +/- 0.002</b>
ubRMSE (m <sup>3</sup> /m <sup>3</sup> )	0.054 +/- 0.003	<b>0.052 +/- 0.003</b>

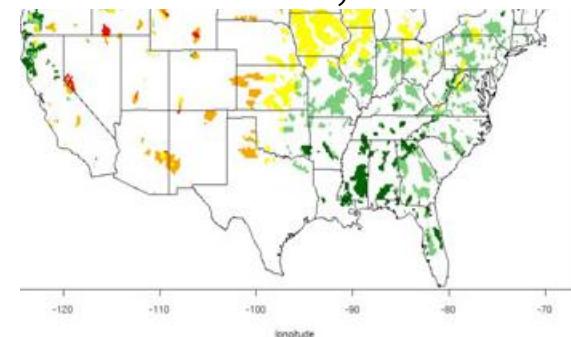
<b>SCAN (root zone soil moisture)</b>	<b>Open loop (no DA)</b>	<b>Soil moisture DA</b>
Anomaly R	0.60 +/- 0.02	<b>0.62 +/- 0.02</b>
Anomaly RMSE (m <sup>3</sup> /m <sup>3</sup> )	0.037 +/- 0.002	<b>0.037 +/- 0.002</b>
ubRMSE (m <sup>3</sup> /m <sup>3</sup> )	0.048 +/- 0.003	<b>0.046 +/- 0.003</b>

**Acknowledgements:** Rolf Reichle and Gabrielle de Lannoy (NASA GMAO) for the quality controlled SCAN data and Mike Cosh (USDA ARS) for the ARS CalVal data

# Soil moisture DA (ECV): Evaluation of streamflow



961 unregulated basins  
as in Xia et al., 2012



Improvements to the streamflow simulations are observed in most basins except Arkansas-red, Upper Colorado, Lower Colorado, Great basin.

## Streamflow (USGS)

### Open loop (no DA)

### ECV DA

RMSE (m³/s)

51.8 +/- 1.0

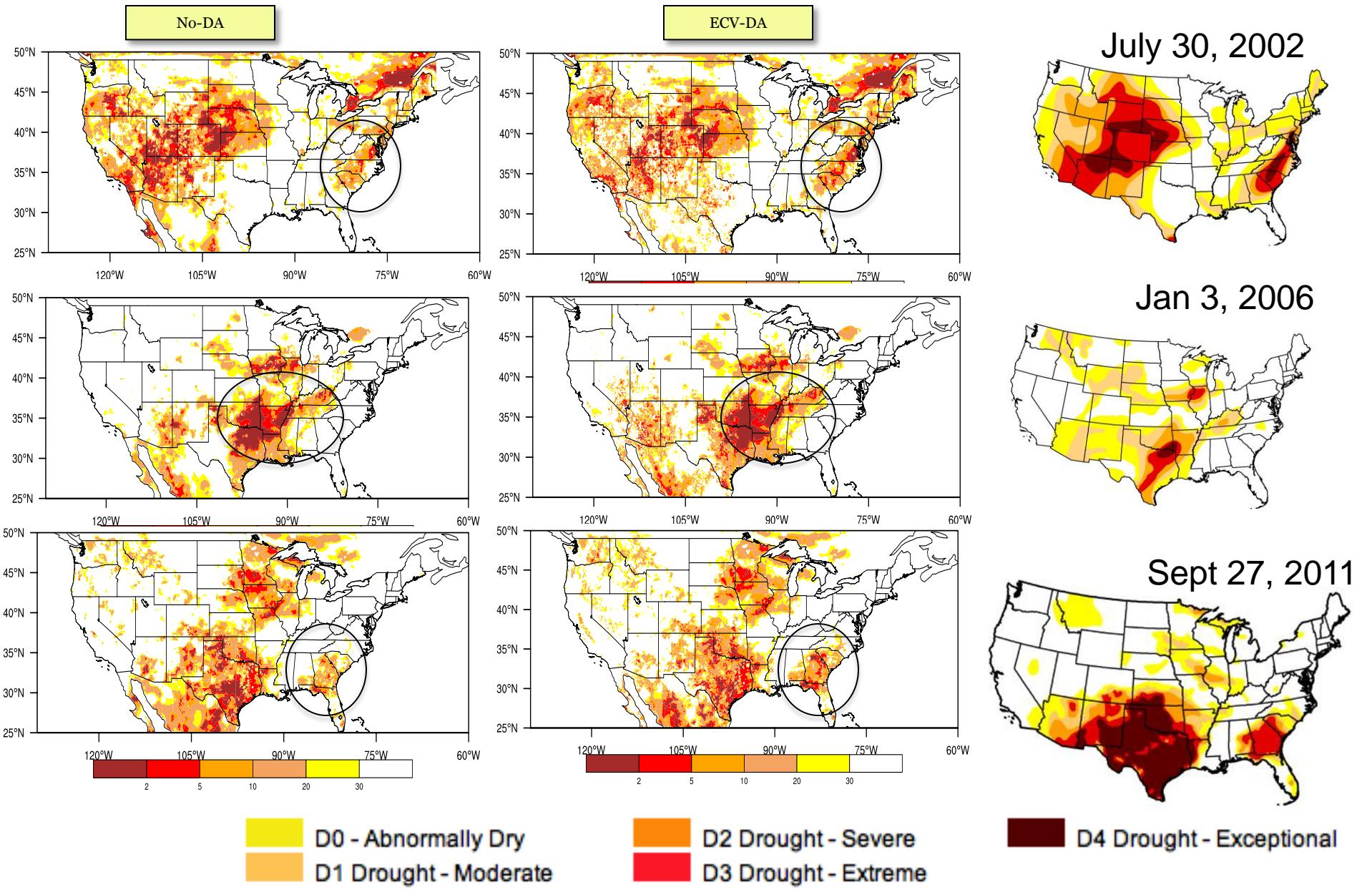
**45.9 +/- 1.0**

Bias (m³/s)

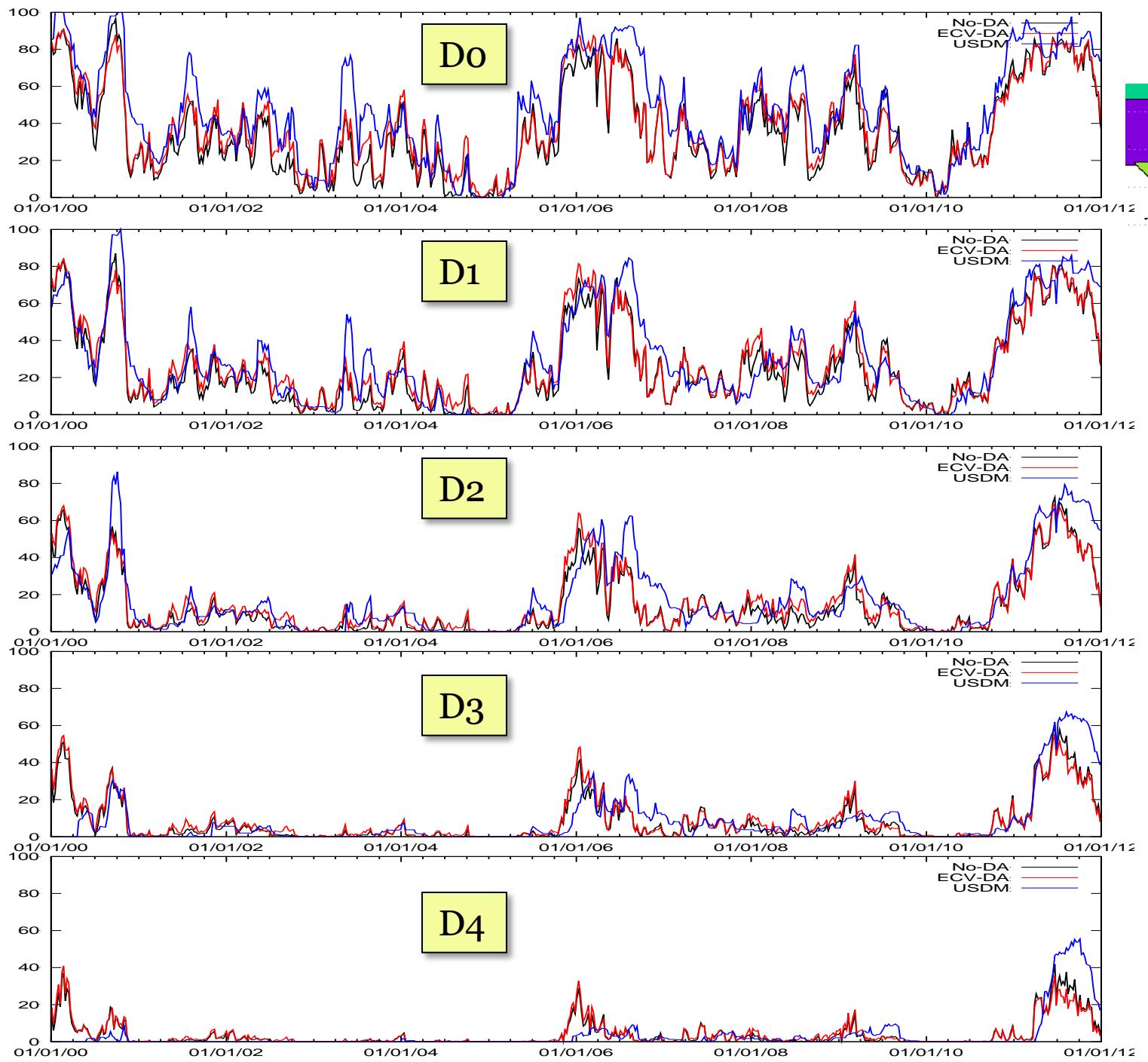
20.1 +/- 1.0

**12.2 +/- 1.0**

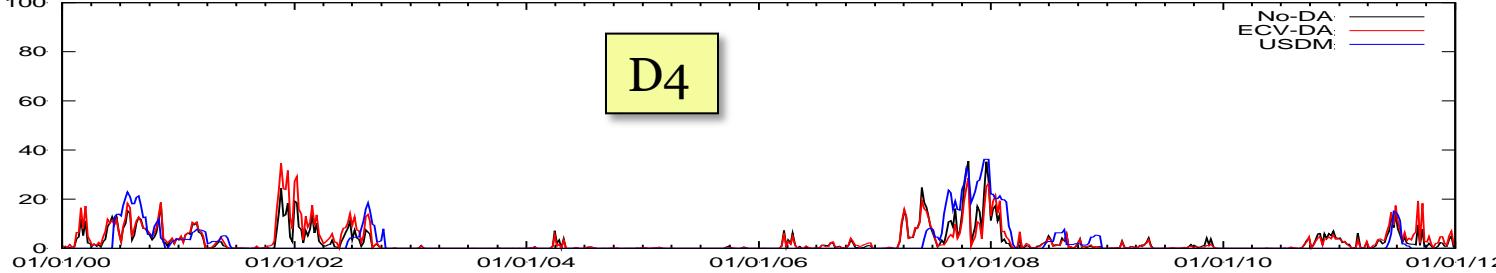
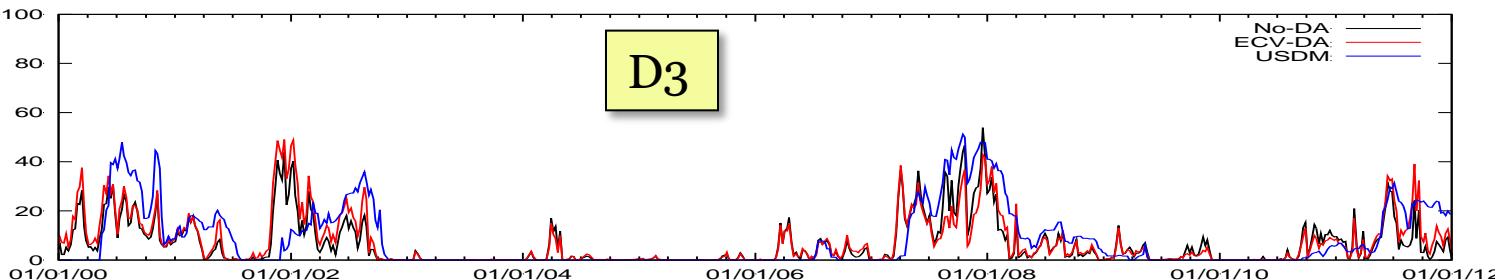
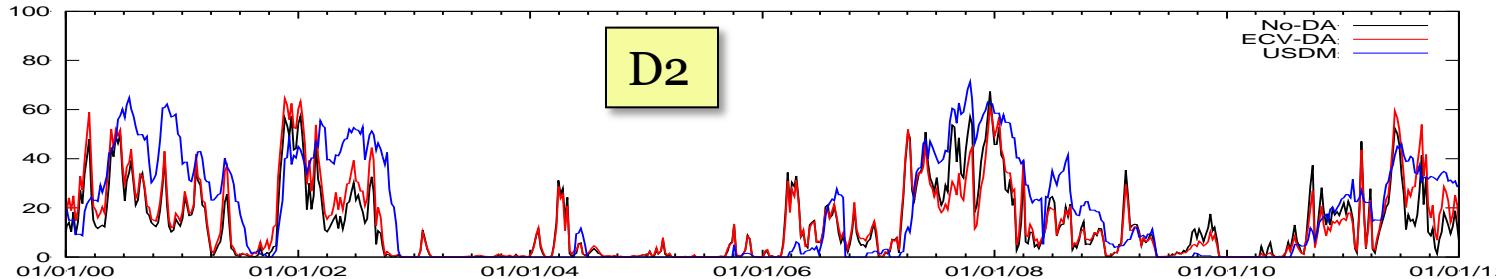
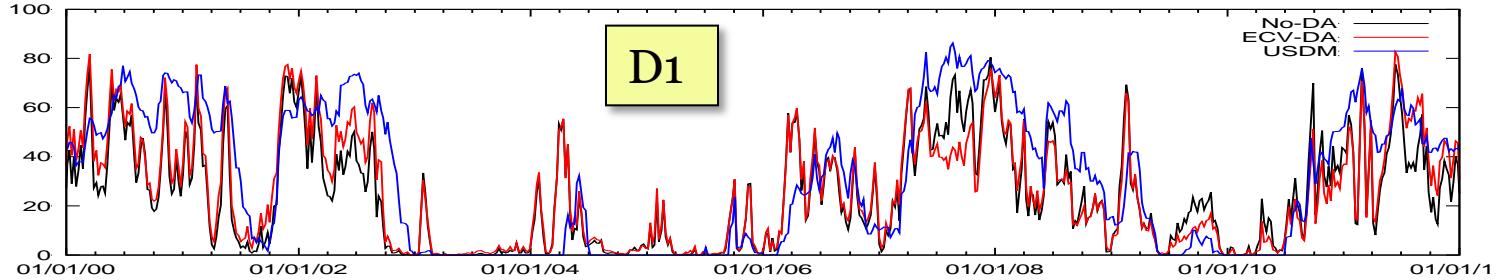
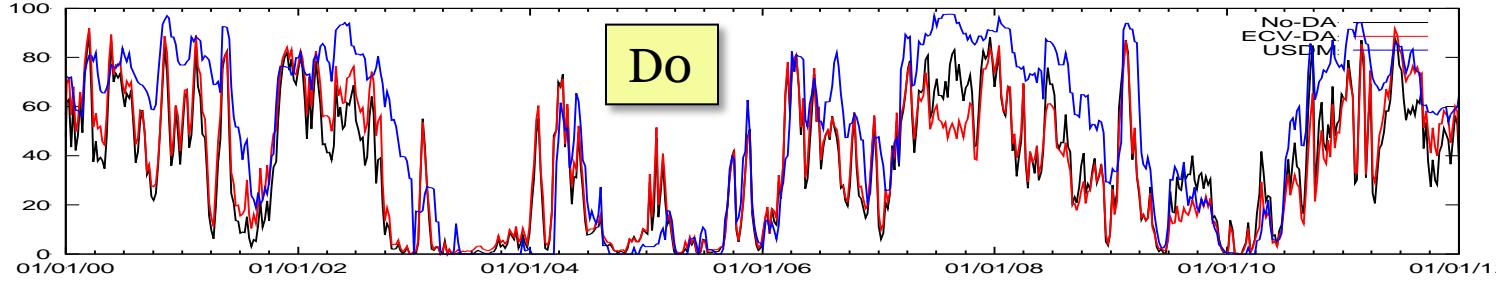
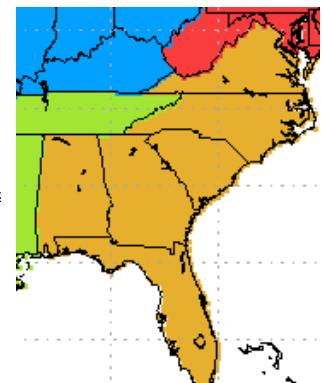
# Comparison against USDM



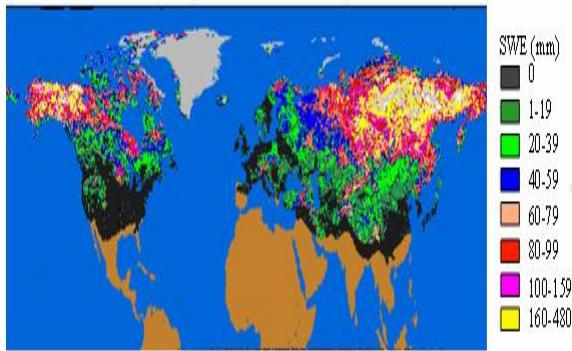
South



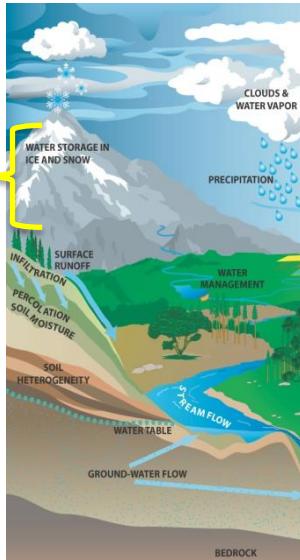
# Southeast



# Snow Data Assimilation



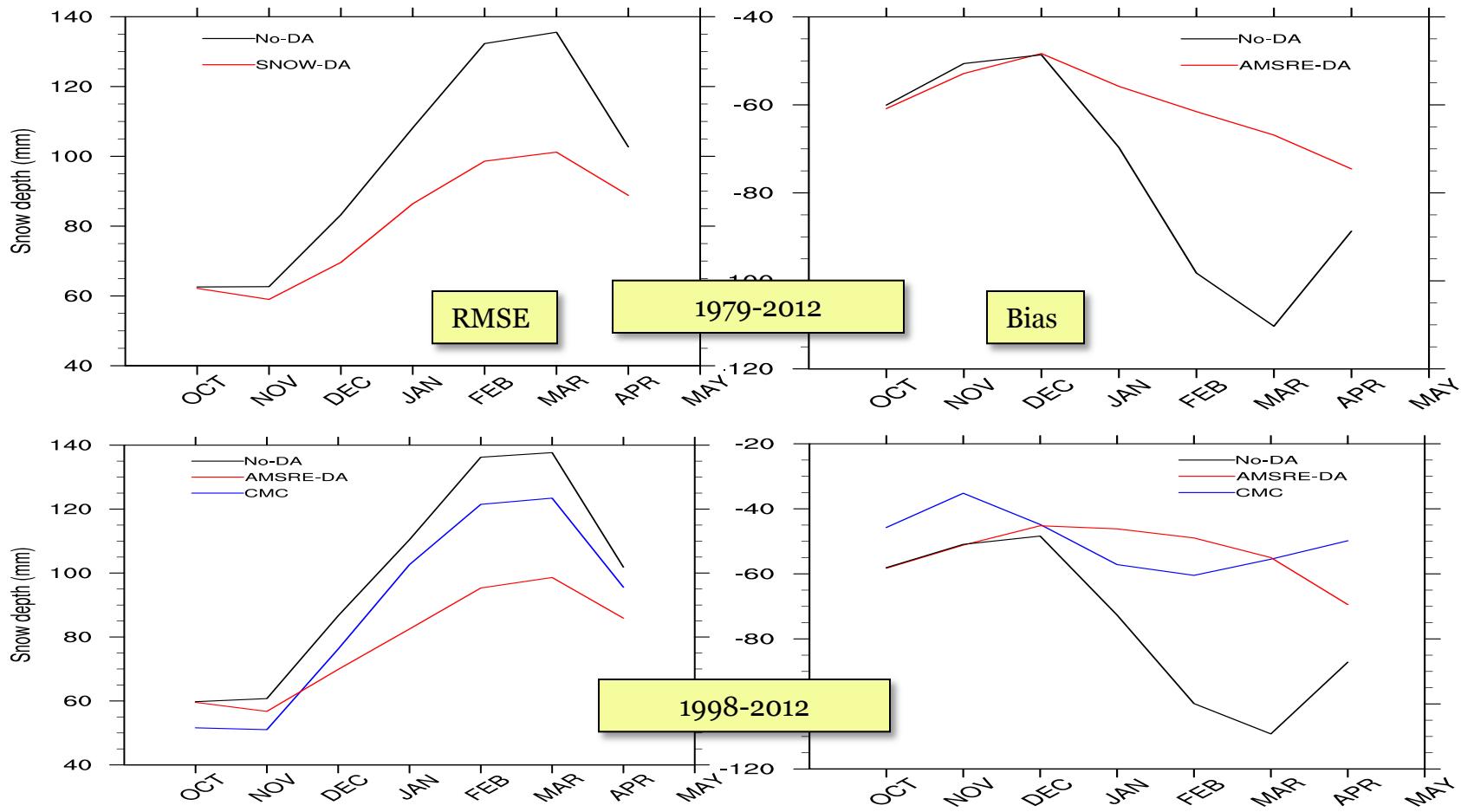
**Figure 1:** Snow water equivalent (SWE) based on Terra/MODIS and Aqua/AMSR-E. Future observations will be provided by JPSS/VIIRS and DWSS/MIS.



## Data Assimilation:

- SMMR (spans 1978-1987), SSM/I (spans 1987-2002) and AMSR-E (spans 2002-2011); SMMR and SSM/I retrievals are based on the Chang et al. (1987) and AMSR-E retrievals are based on the improved retrieval algorithm from Kelly et al. (2009).
- AMSR-E retrievals are further improved by combining the information from MODIS snow cover retrievals – a product known as ANSA (AFWA NASA snow algorithm; Foster et al. 2010).

# Snow DA (SMMR+SSM/I+AMSR-E) : Evaluation of snow depth fields

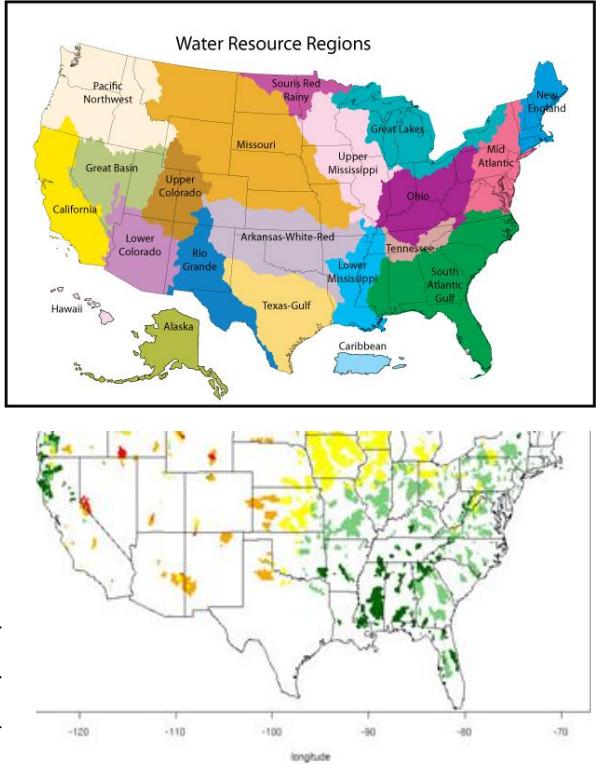
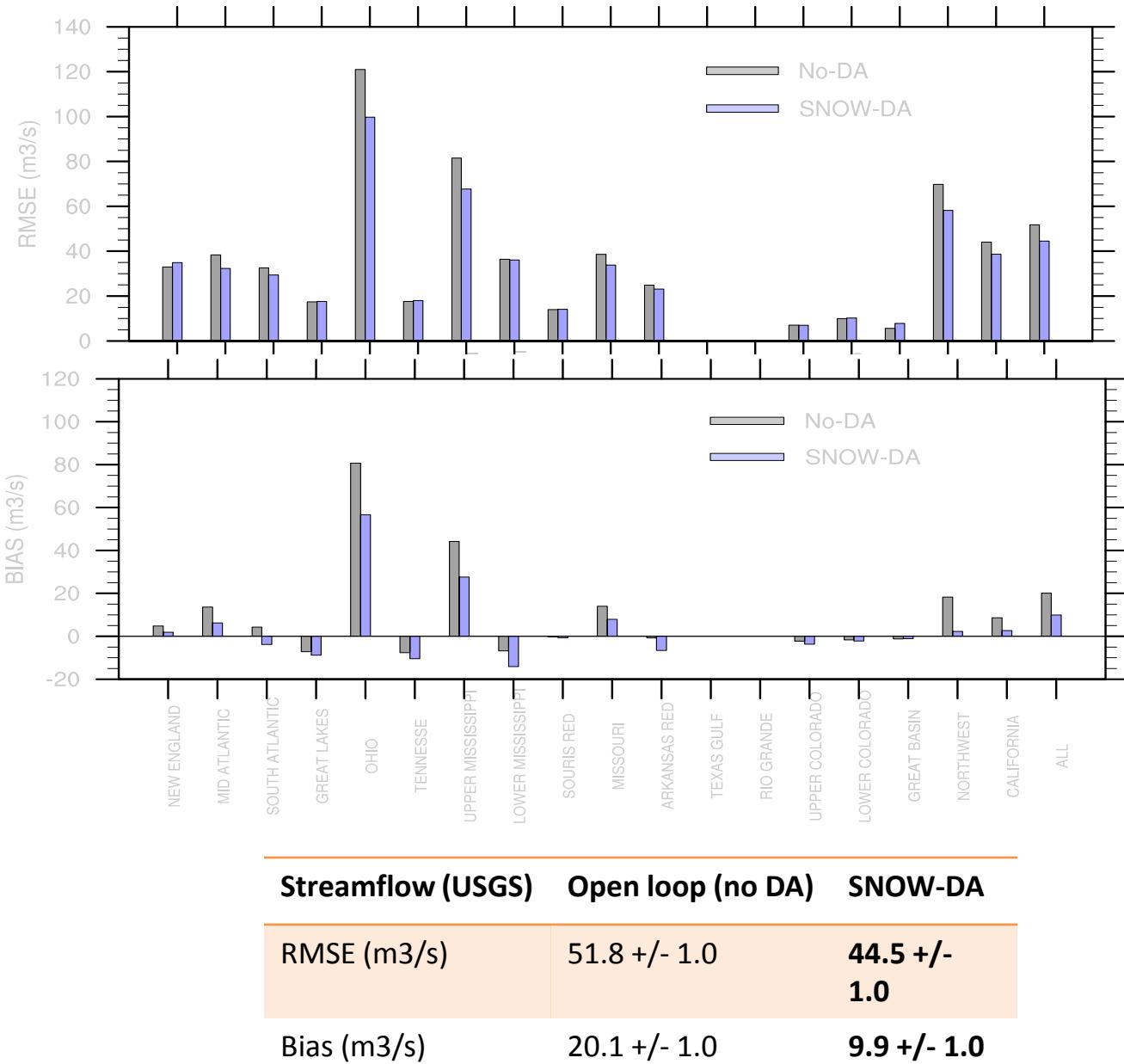


Snow depth (GHCN)	No-DA	SNOW-DA	CMC
RMSE (mm)	151.0 +/- 5.0	<b>114.0 +/- 5.0</b>	135.0 +/- 5.0
Bias (mm)	-80.0 +/- 5.0	<b>-48.9 +/- 5.0</b>	-53.2 +/- 5.0

The assimilation of gauge-corrected snow EDR provides significant improvements to the snow depth fields, primarily over the peak winter and spring melt periods.

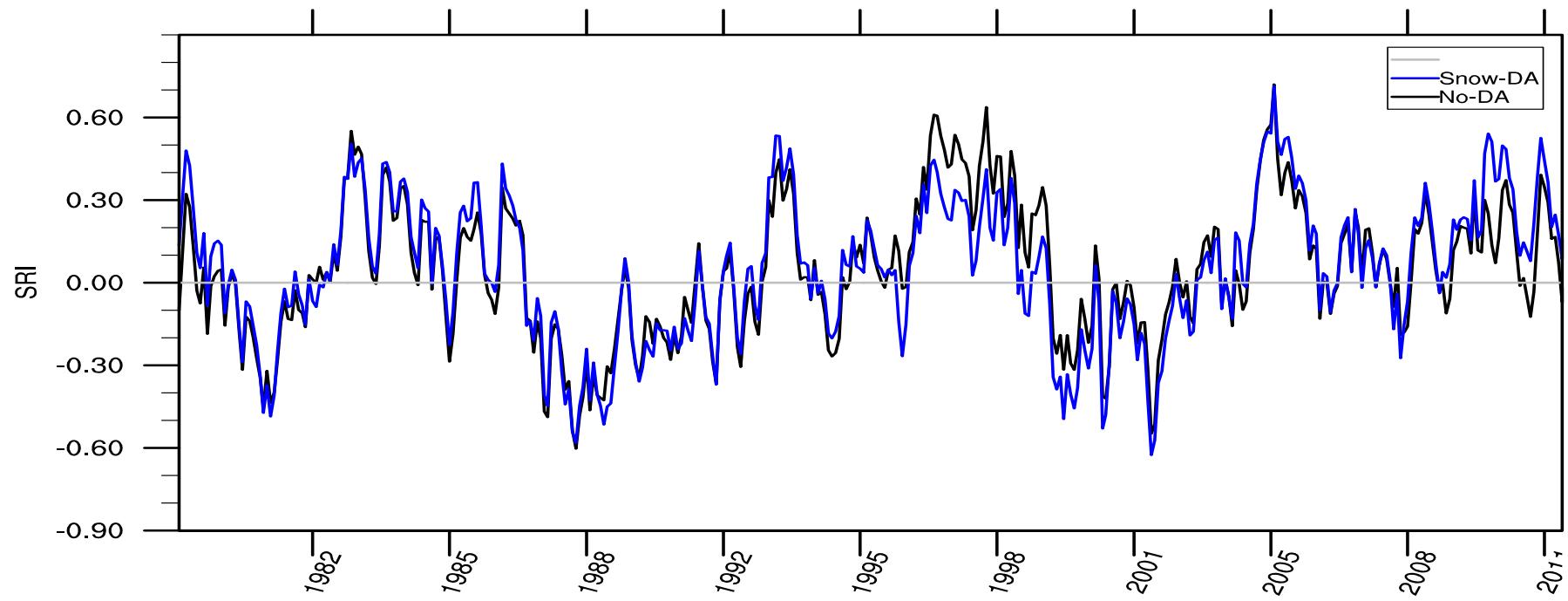
The gauge corrected AMSR-E data shows similar skill to that of CMC

# Snow DA (SMMR+SSM/I+AMSR-E): Evaluation of streamflow over 961 small basins (grouped by USGS hydrologic units)



Significant improvements to the streamflow simulations are observed over most major basins, except over New England.

# Snow DA : Impact on SRI Drought Index for CONUS



## Summary

- Soil moisture assimilation can improve soil moisture, streamflow and evapotranspiration (not shown, see Peters-Lidard et al., 2011)
- Soil moisture assimilation can change area in D0-D4 threshold percentiles used to diagnose drought
- Bias-corrected AMSR-E Snow depth assimilation improves snow depth and streamflow. Other results (not shown) show some potential for MODIS/SCA, especially in snow transition regions or spring snowmelt.
- Snow assimilation has a significant effect on drought metrics such as Surface Runoff Index (SRI)

# Additional References

- Peters-Lidard, C.D, S.V. Kumar, D.M. Mocko, Y. Tian, 2011: Estimating evapotranspiration with land data assimilation systems, *Hydrological Processes*, 25(26), 3979--3992, DOI: 10.1002/hyp.8387
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